

# Managing Forests for Sustainable Harvest and Wildlife Habitat Using Earth Observations and Modeling of Forest Structure and Landscape Connectivity

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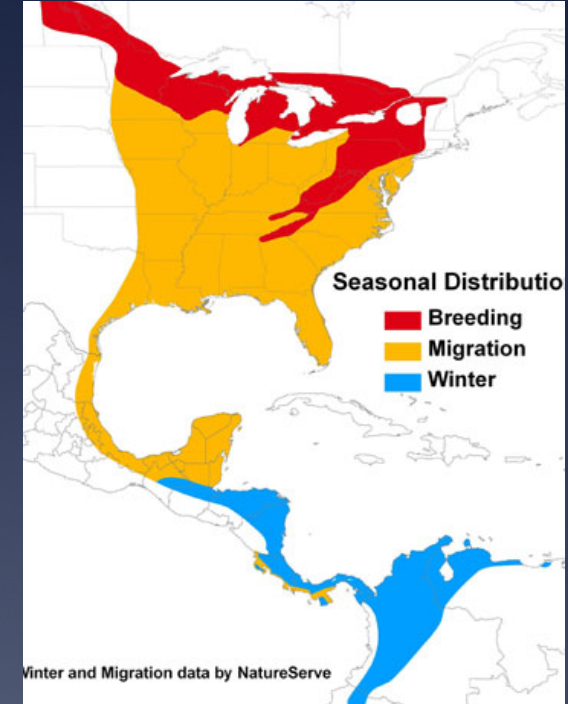
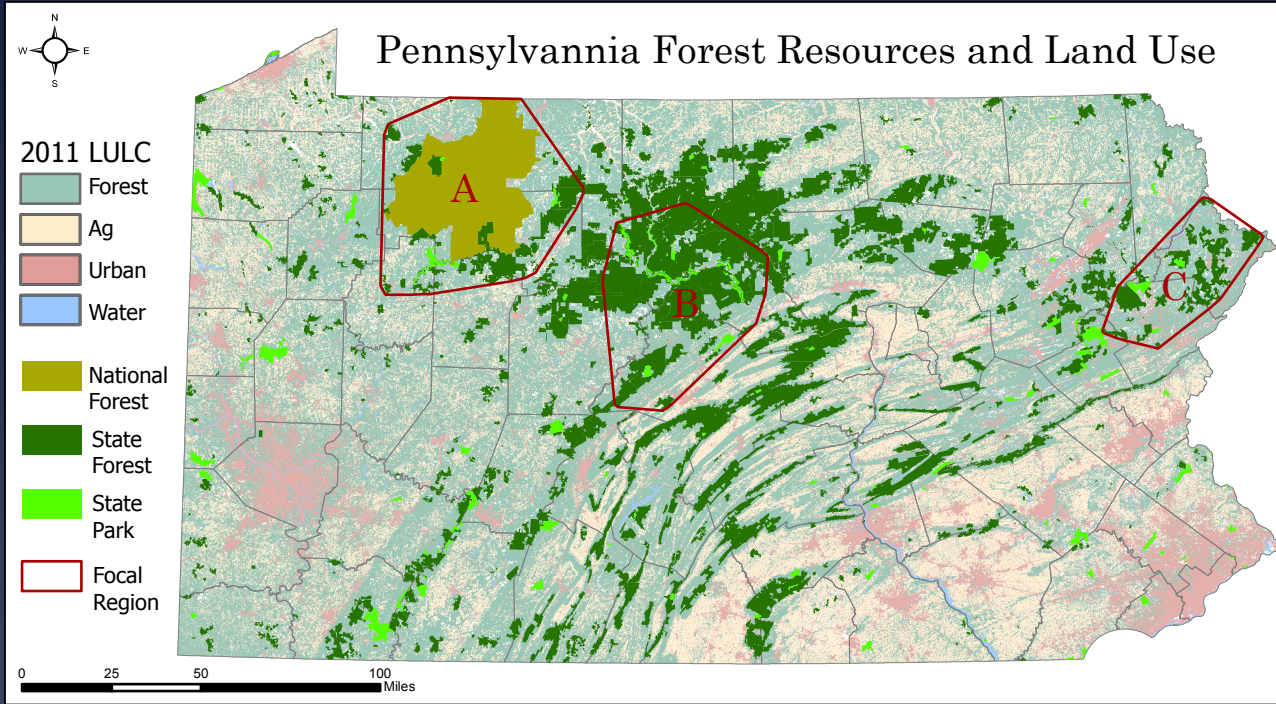
Joseph Petroski  
PA Department of Conservation  
and Natural Resources



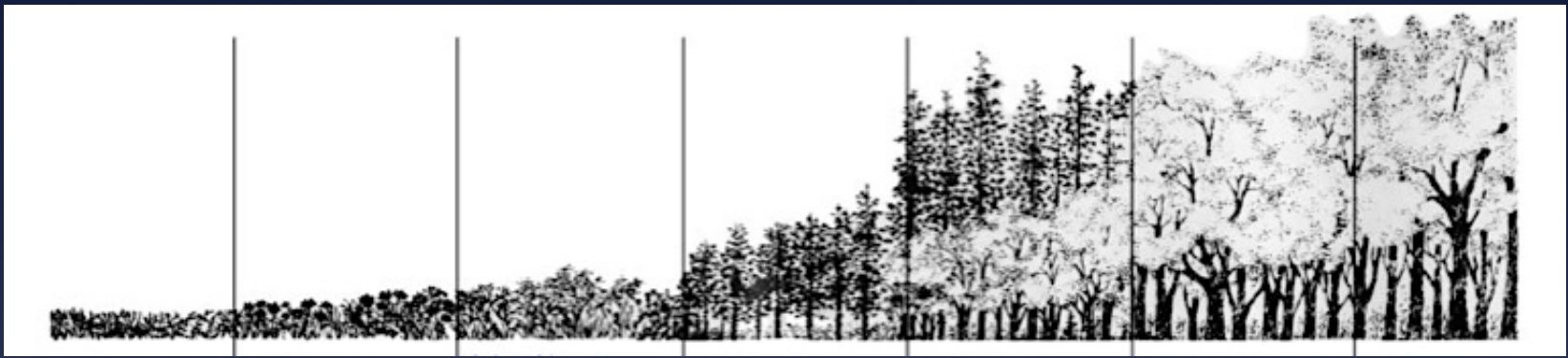
Ben Jones  
PA Game Commission



# Management of PA forests for bird habitat



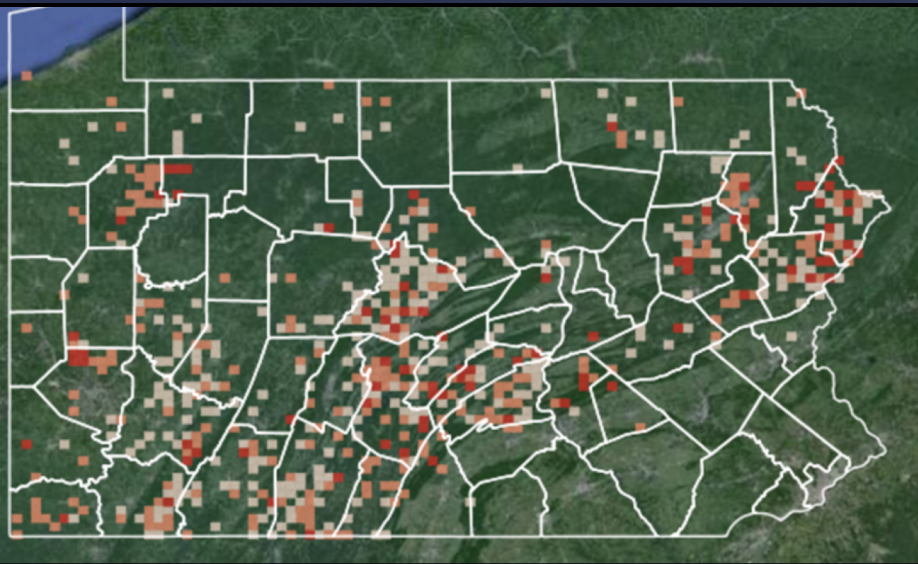




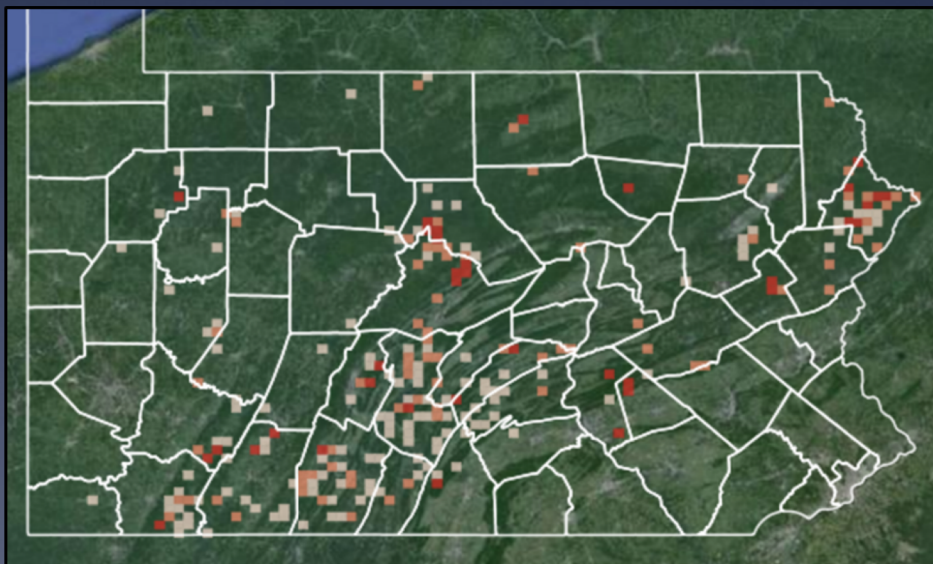
- \* 40% of the 16.7 million acres of forest in PA are greater than 80 years old
- \* >50% of PA forests are fully stocked with a net growth-to-removal ratio of 2:1
- \* Lack of early successional forest habitat is associated with **declines** in populations of Golden-winged Warbler, Cerulean Warbler, and Wood Thrush.
- \* **Increases** in population size observed in a variety of other bird species, including the Pileated woodpecker, Yellow-bellied sapsucker, Acadian Flycatcher, Yellow-throated vireo, Ovenbird, Worm-eating warbler, Hooded-warbler, Magnolia warbler, Black-throated blue warbler, and Black-throated green warbler.

# Golden-winged Warblers population decline

- \* ~2.3% decline per year range wide (North American BBS; Sauer et al. 2017)
- \* 61% decline in occupancy in 20 yrs (PA Breeding Bird Atlas)



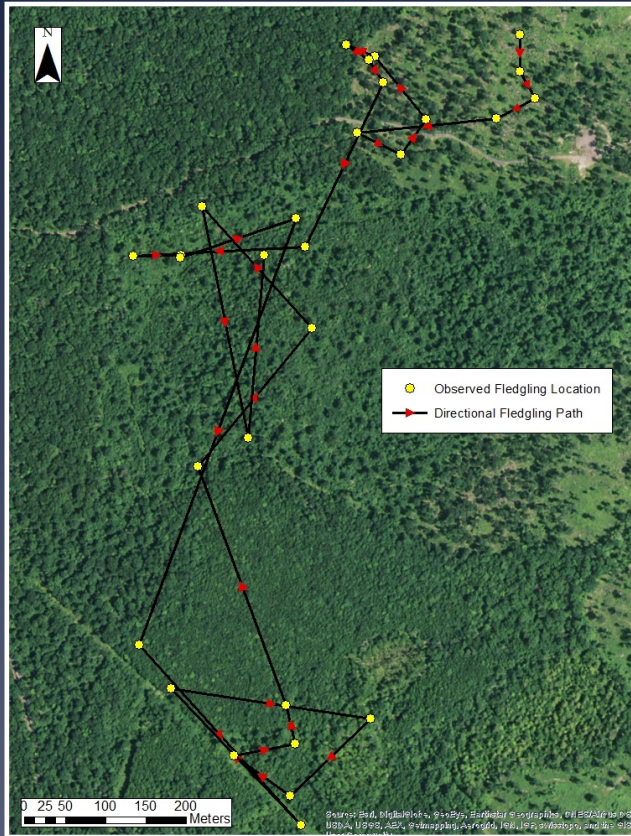
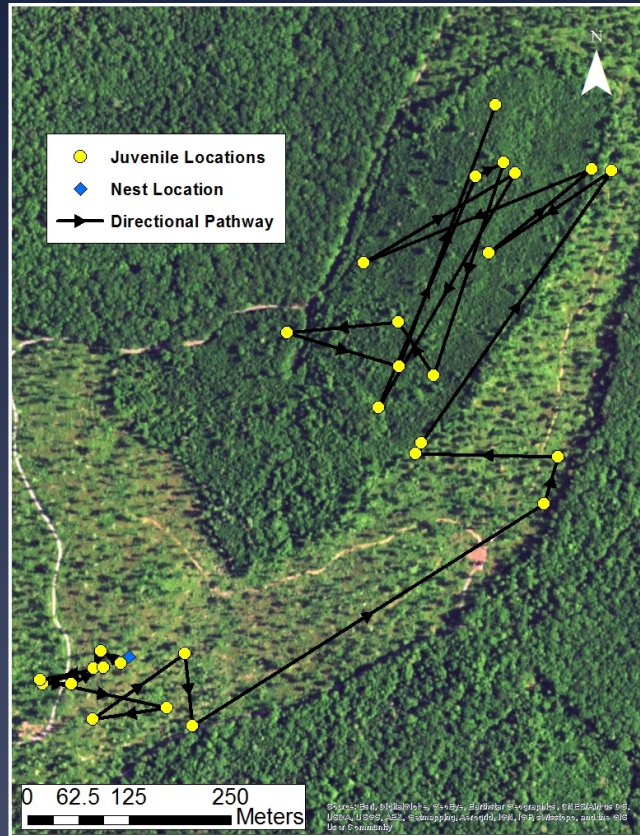
1st PA Breeding Bird Atlas (1984-1988)



2nd PA Breeding Bird Atlas (2004-2008)

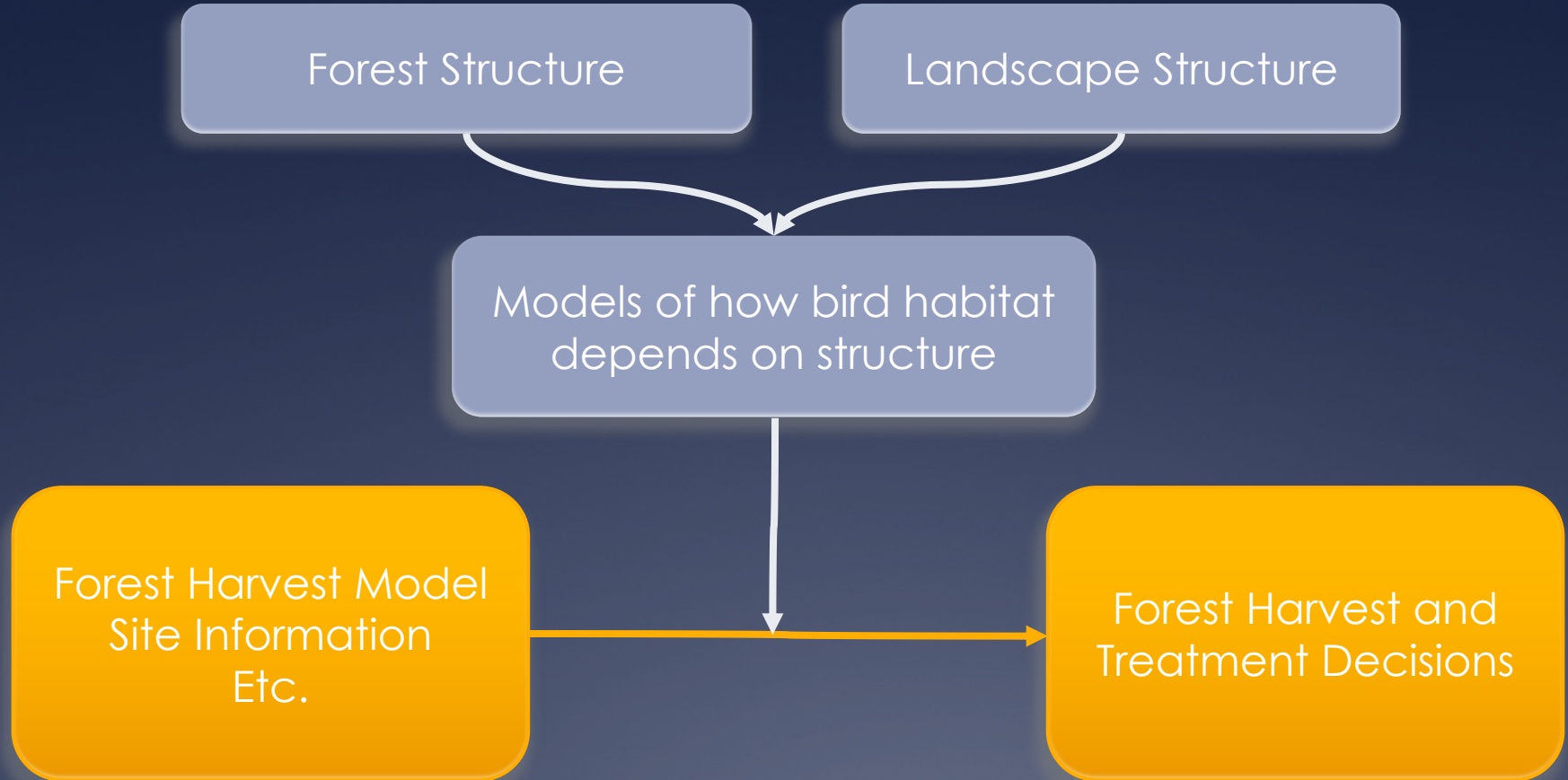


# Fledgling movement data demonstrate the importance of landscape structure



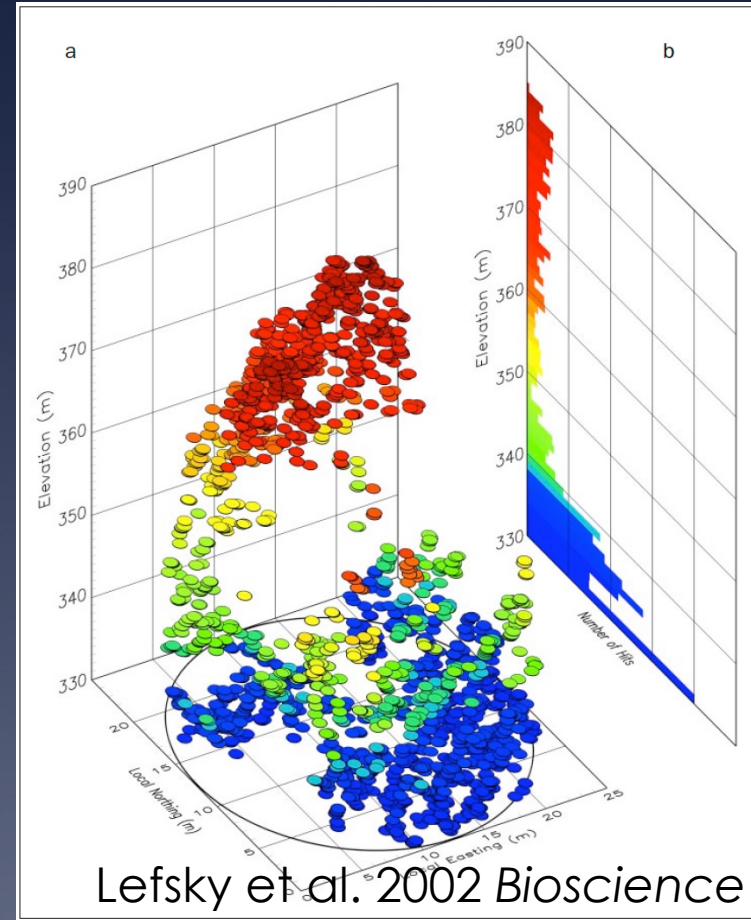


# Project Conceptual Framework



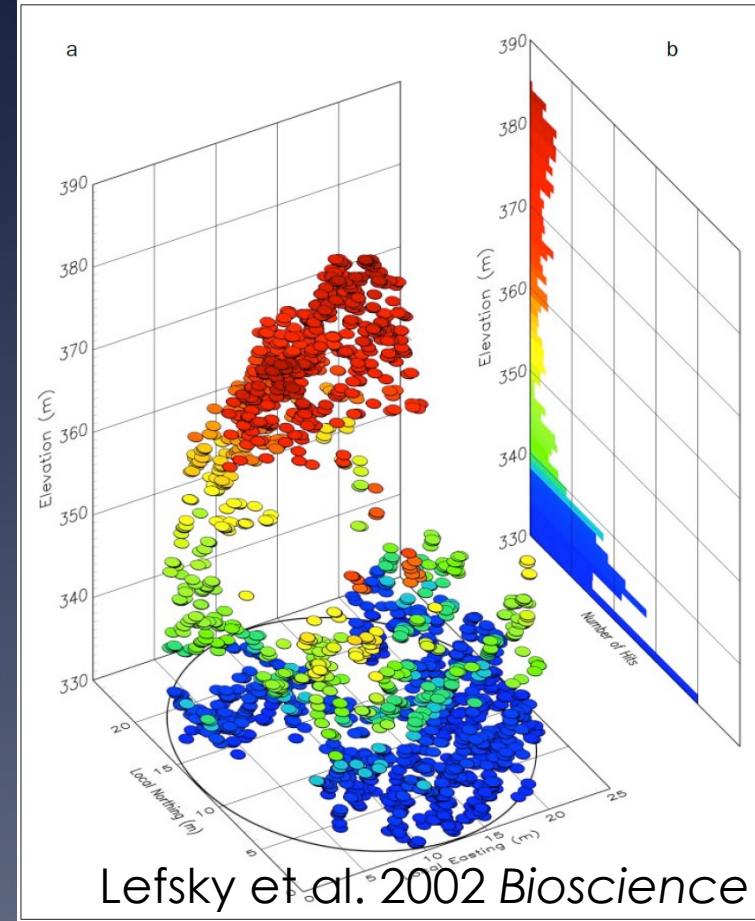
# Lidar Metrics

1. Mean canopy height (CH)
2. 95% Canopy Height
3. Standard deviation of CH
4. Coefficient of variation of canopy height
5. Percent of first returns > 2m
6. Percent of first returns > mean canopy height
7. Height of the median return (HOME)
8. Vertical distribution ratio (VDR)



# Statistical Description

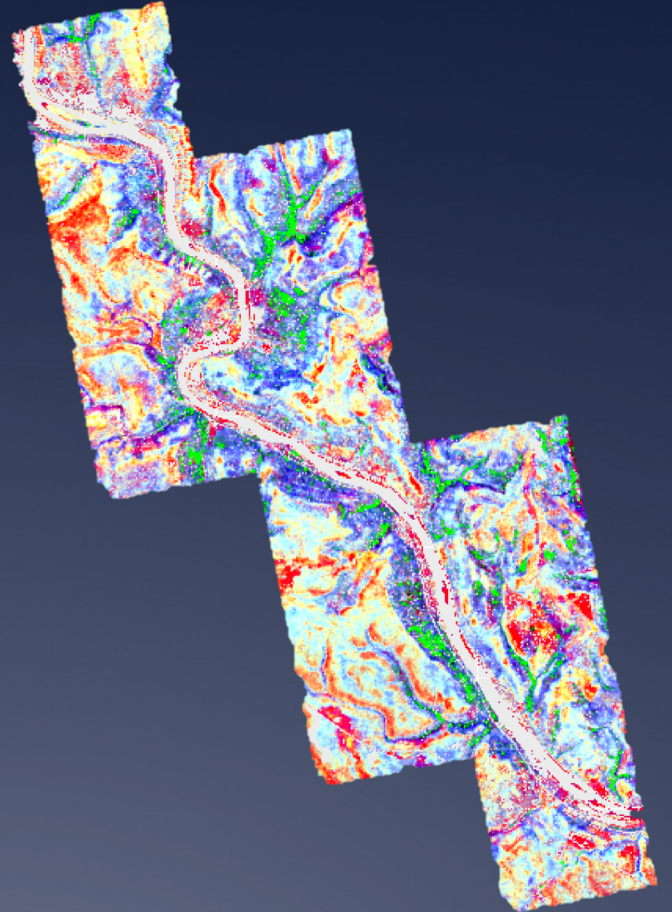
1. Use Principal Components Analysis (PCA) to condense variability in LiDAR point cloud into a few dimensions
2. Use this reduced dimensionality to quantify forest structure, classify patches, and as covariates of bird habitat suitability
3. Based on proportions of returns in each voxel – and intensity & greenness



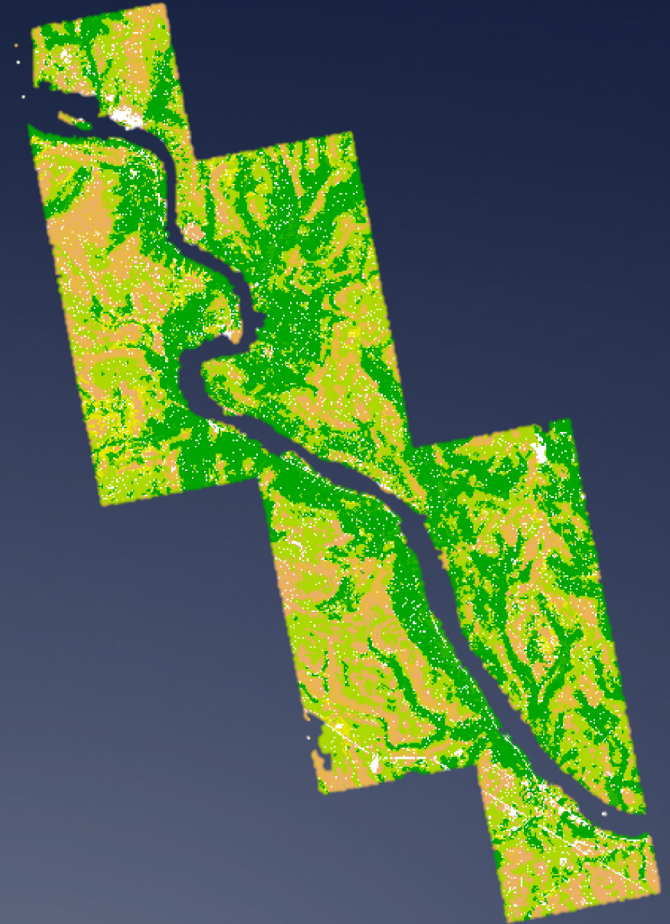
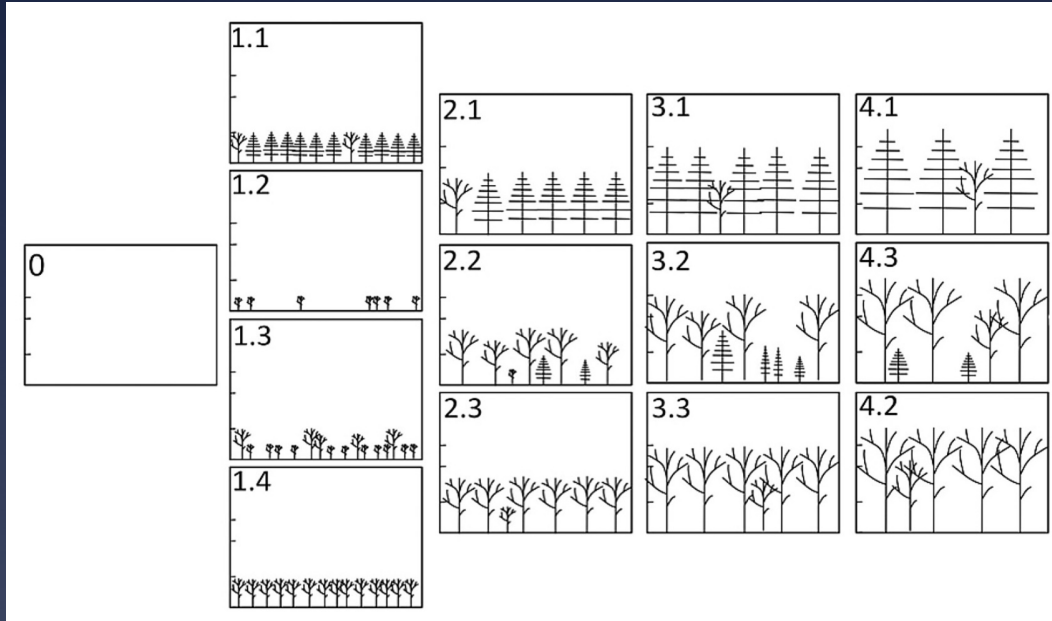


# PCA of forest structure

1. First 3 PCs plotted as Red / Green / Blue
2. ~20% of variance explained
3. Can be submitted to clustering algorithms to produce discrete forest classification



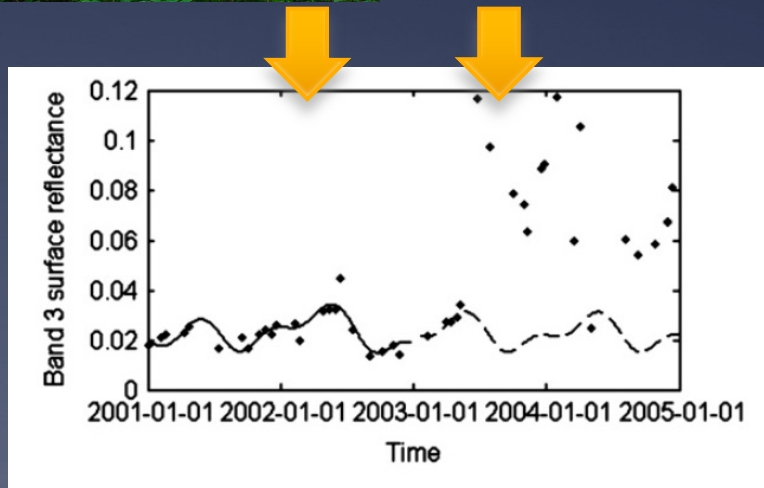
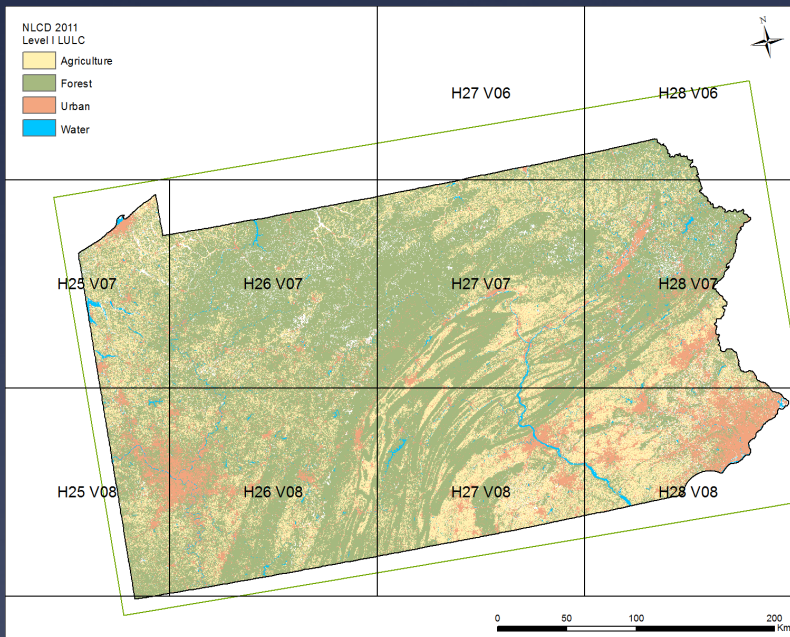
# Forest Structure Classes



Dickinson et al. *Can. J. For. Res.*  
44: 301–312 (2014)

# Updating LiDAR forest structure using Landsat time series of forest disturbance

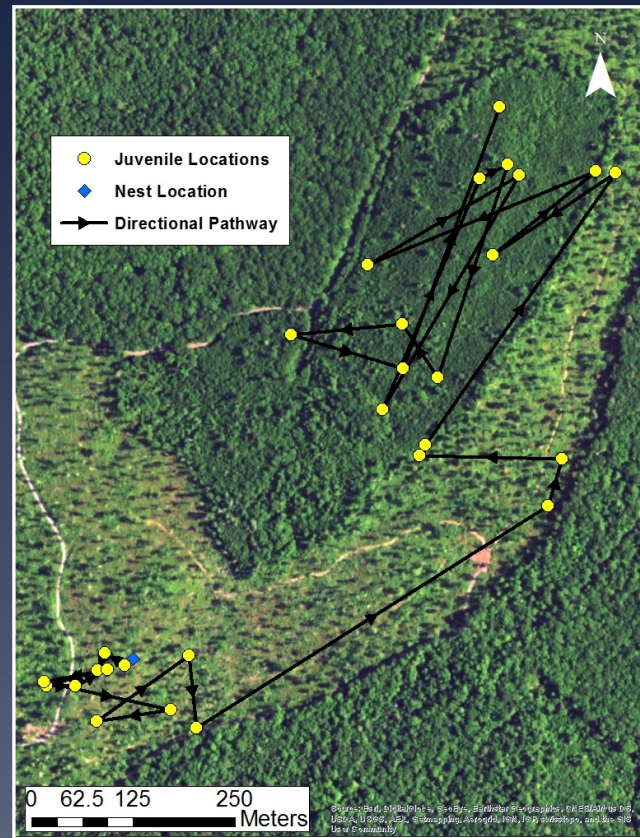
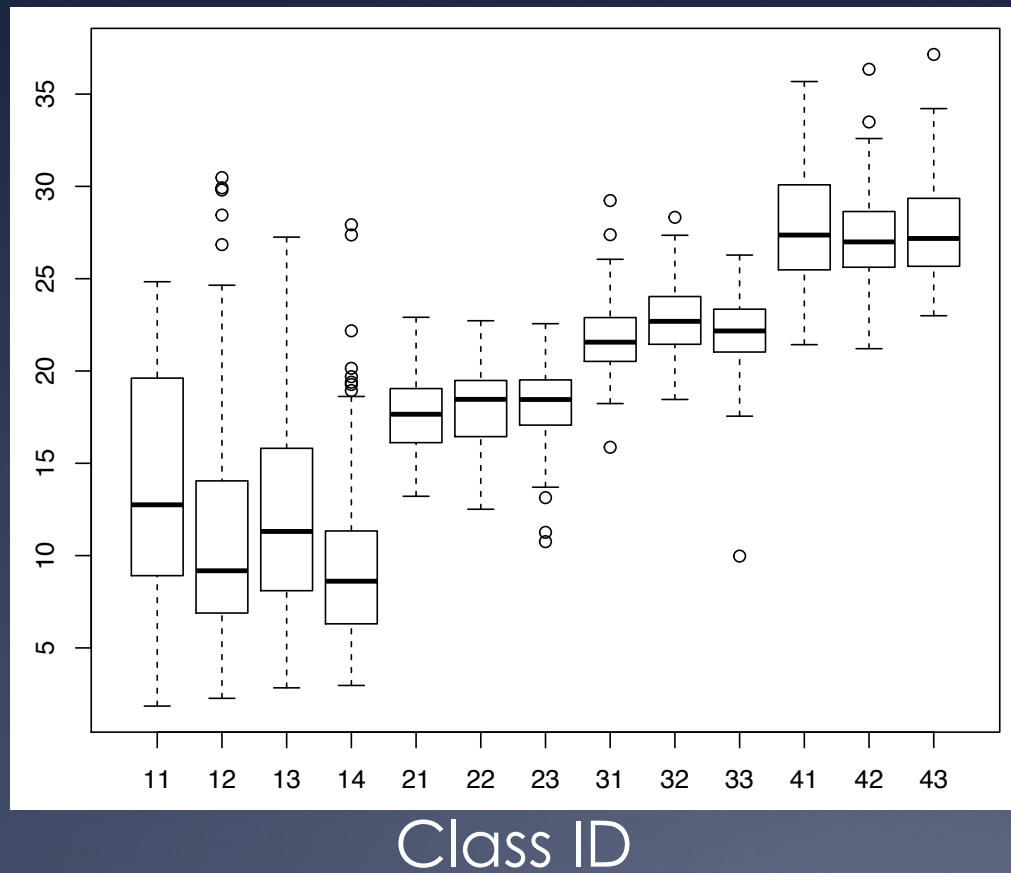
Continuous Change  
Detection and Classification  
(CCDC; Zhu et al. (2012))





# Example LiDAR metric across classes

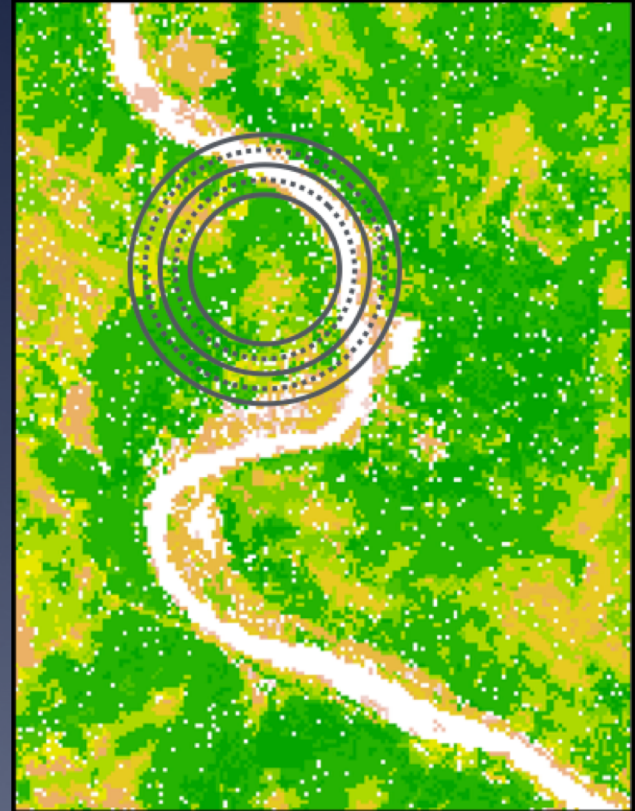
95<sup>th</sup> Percentile Canopy  
Height (m)

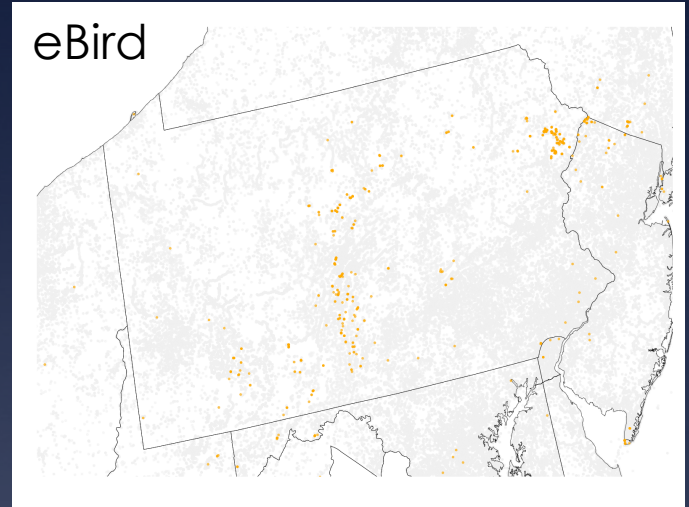
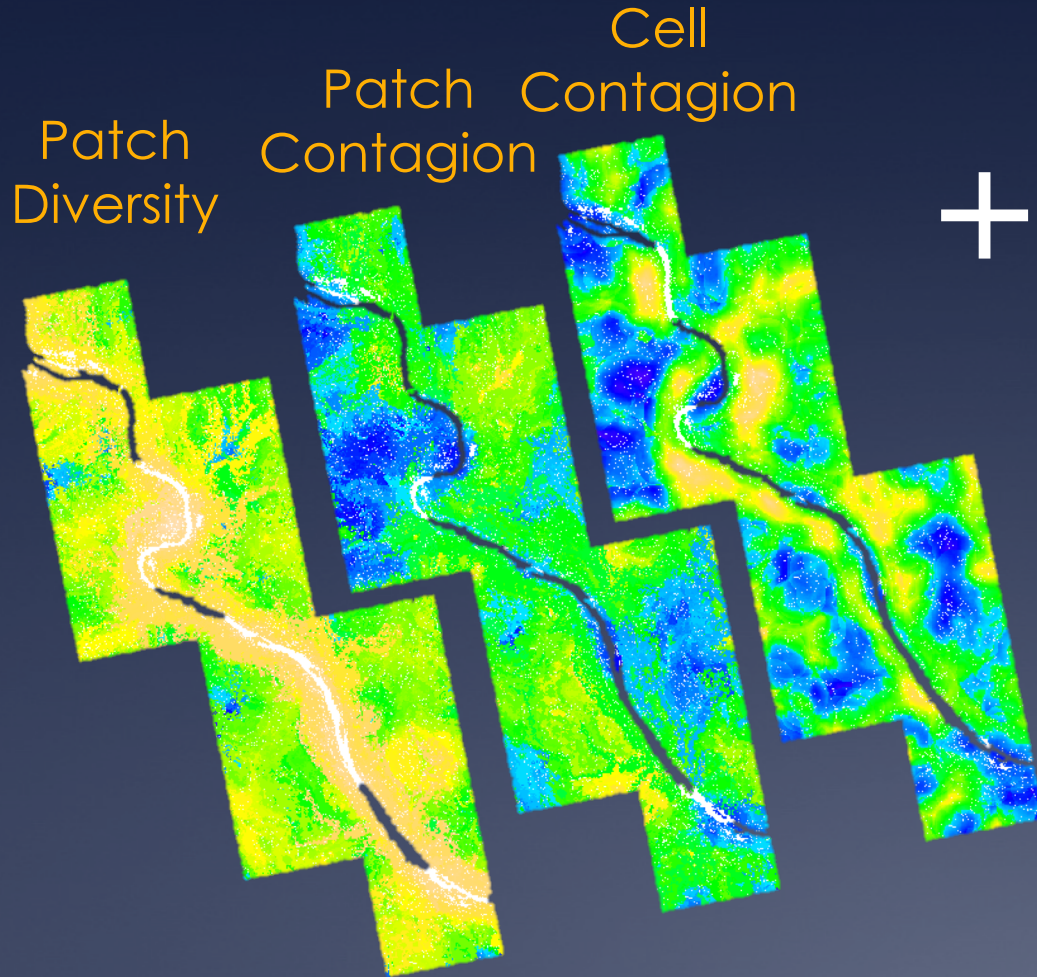


# Landscape structure

Focus on quantifying composition & configuration of forest patch types at different distances from patches

1. Richness – The number of patch classes
2. Shannon's Diversity – accounts for proportional abundance of each class
3. Contagion – accounts for proportional abundance and class adjacency type
4. Shape – ratio of patch perimeter divided by patch area
5. Proximity – sum of patch area and squared distance between patches of the same class
6. Edge density – the total length of edge divided by the focal area

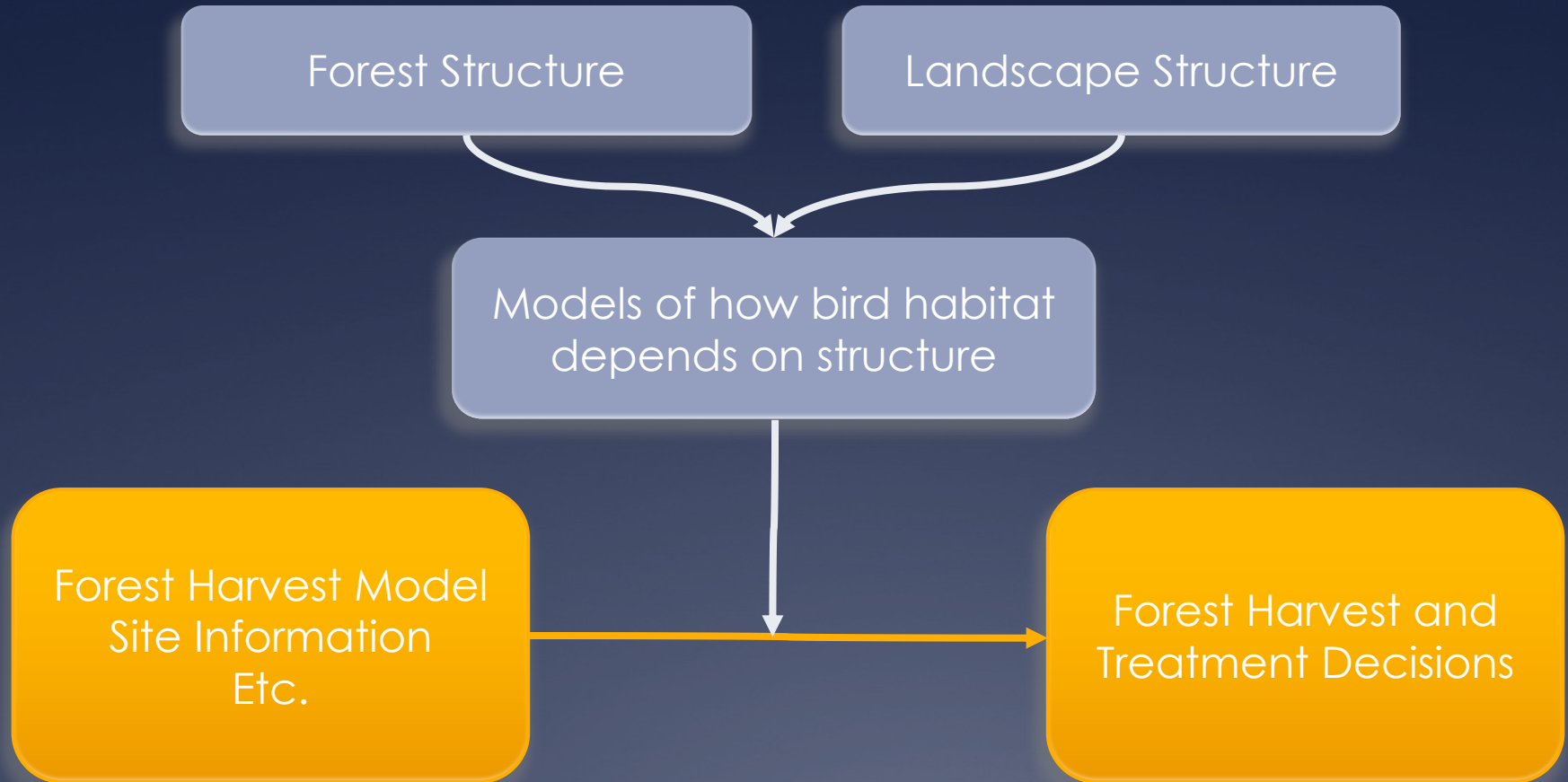




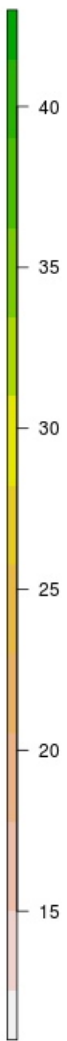
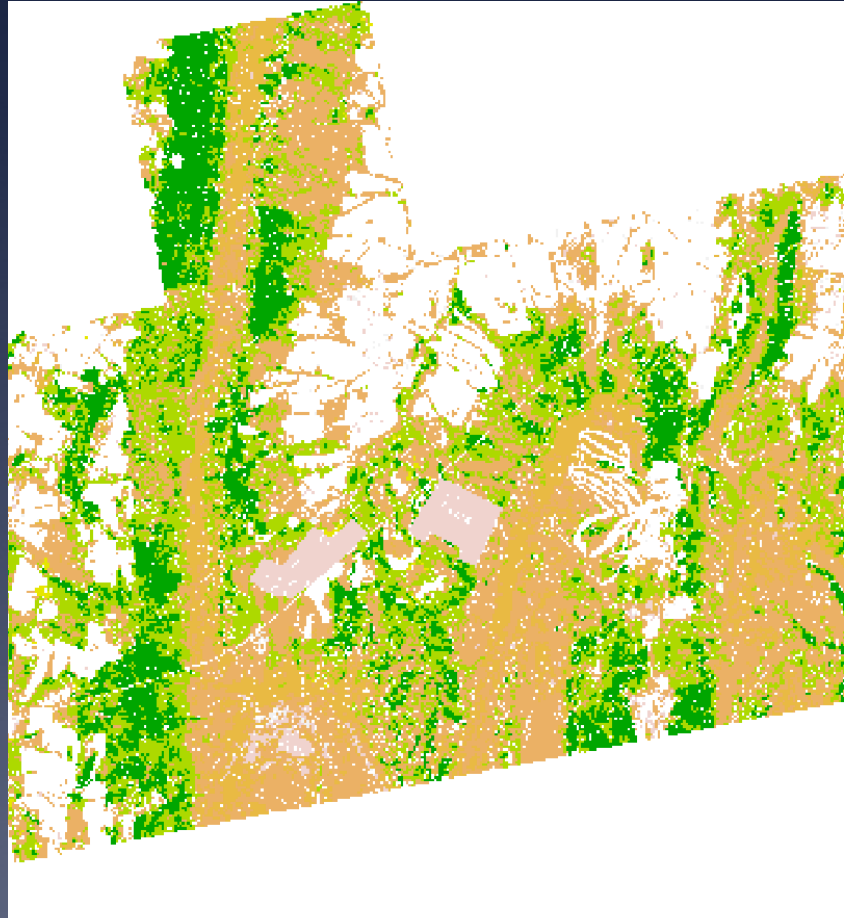
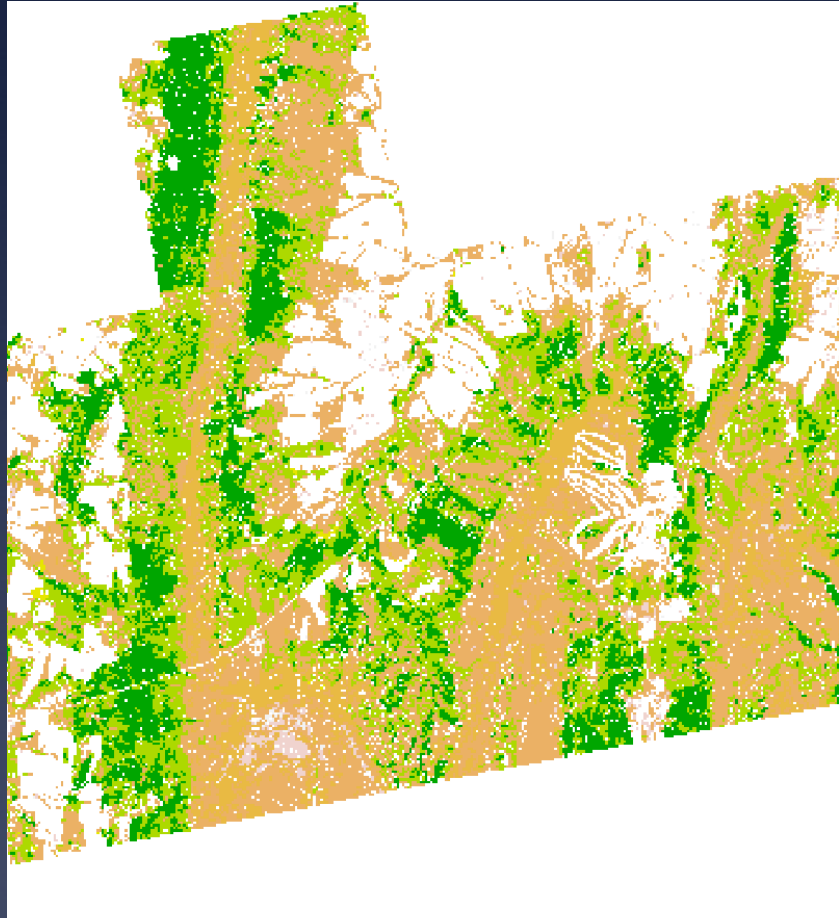
Occupancy  
models for a suite  
of bird species of  
management  
interest



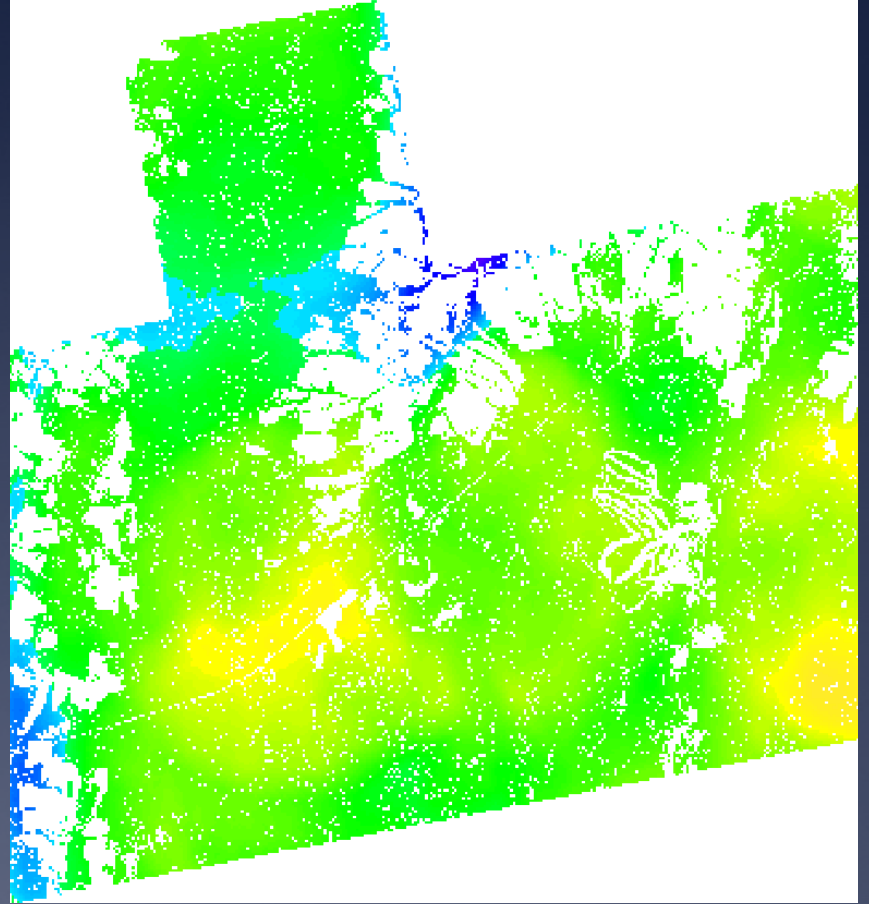
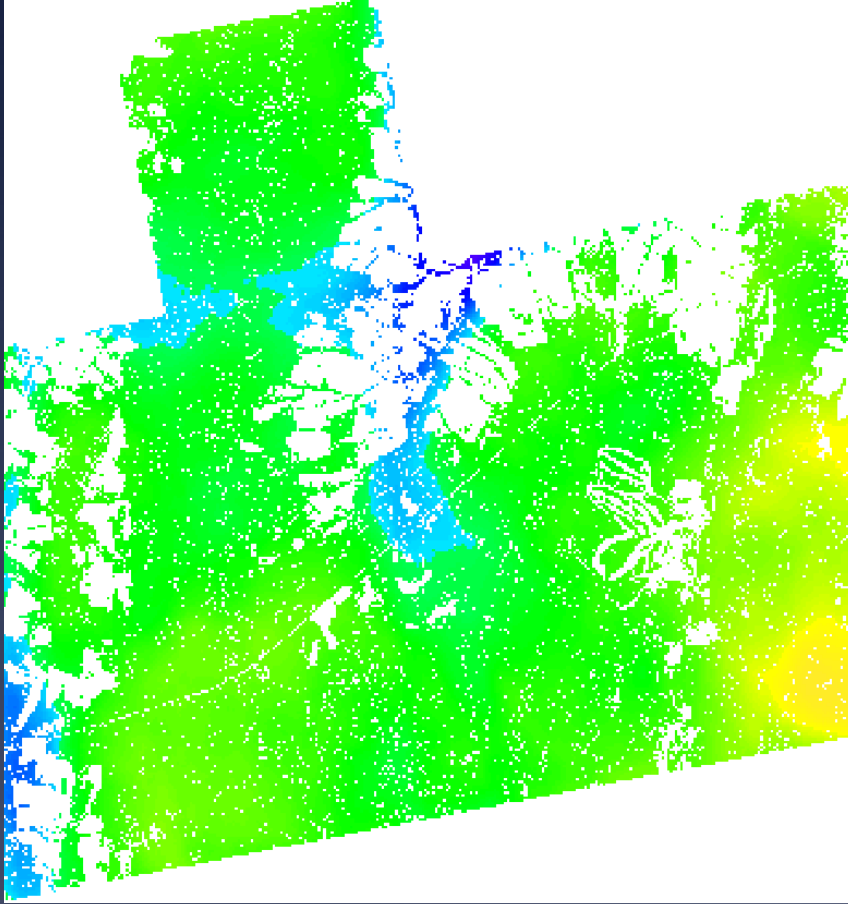
# Project Conceptual Diagram



# Forest Structure Before and After Harvest



# Landscape structure before and after harvest





# Things that could go wrong

- \* Remote sensing-based forest structure won't capture the finer aspects of forest structure important for habitat.
- \* Landscape structure metrics won't be an important predictor of bird occurrence.
- \* The model works really well and supports cutting down all the forests to increase bird habitat to the detriment of other species.

